

# **Tropical Cyclone Rapid Intensity Change Forecasting Using Lightning Data during the 2010 GOES-R Proving Ground at the National Hurricane Center**

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# Outline

- Lightning activity and tropical cyclone intensity change
- 2005-2009 study of WWLLN lightning density and rapid intensification (RI)
- Experimental RI forecast algorithm for the GOES-R Proving Ground using Vaisala's Global Lightning Dataset (GLD360)
- Results from 2010 tests at NHC

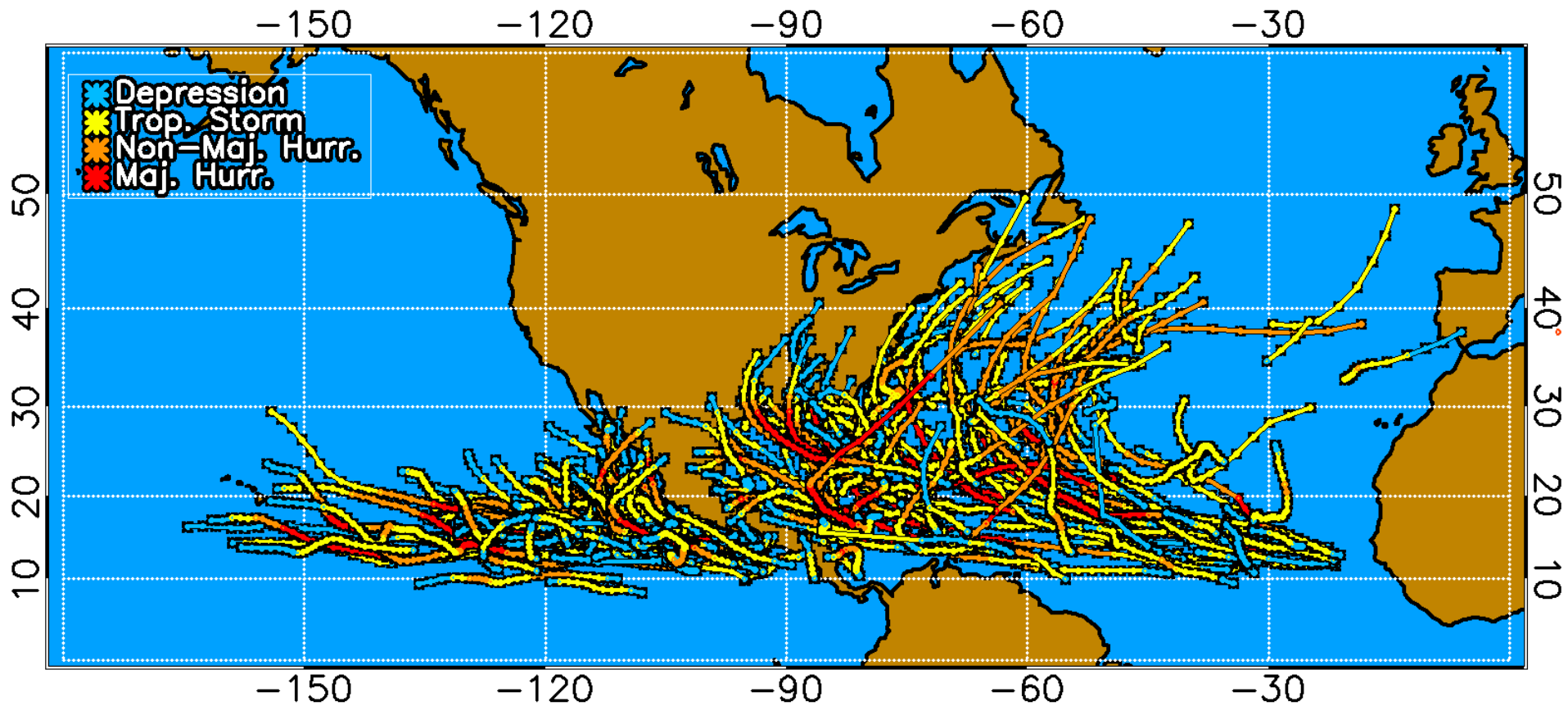
# Lightning and TC Intensity

- Cecil and Zipser (1999)
  - More lightning in weaker storms
  - Little relationship with TC intensity change
  - Small OTD sample
- Squires and Businger (2008)
  - Eyewall lightning outbreaks during rapid intensification of Rita and Katrina
- Price et al. (2009)
  - Lightning increases related to rapid intensification
  - Time lag highly variable
- DeMaria and DeMaria (2009)
  - Rainband lightning most correlated with rapid intensification
  - Largest inner core lightning density with sheared systems
- Abarca et al. (2010)
  - Flash density smaller for hurricanes than non-hurricanes
  - More lightning for intensifying systems
  - Lightning distribution more symmetric for intensifying systems

# Data Sample for Forecast Algorithm

- Full lifecycle of all Atlantic and east Pacific tropical cyclones 2005-2009
  - Over water only
- Storm environmental variables from SHIPS intensity model database
  - SST, vertical shear, etc.
- Storm centered lighting density
  - WWLLN data w/ annual normalization to OTD/LIS
  - 6 hour composites
  - 100 km radial intervals 0 to 600 km

# 2005-2009 Storm Tracks



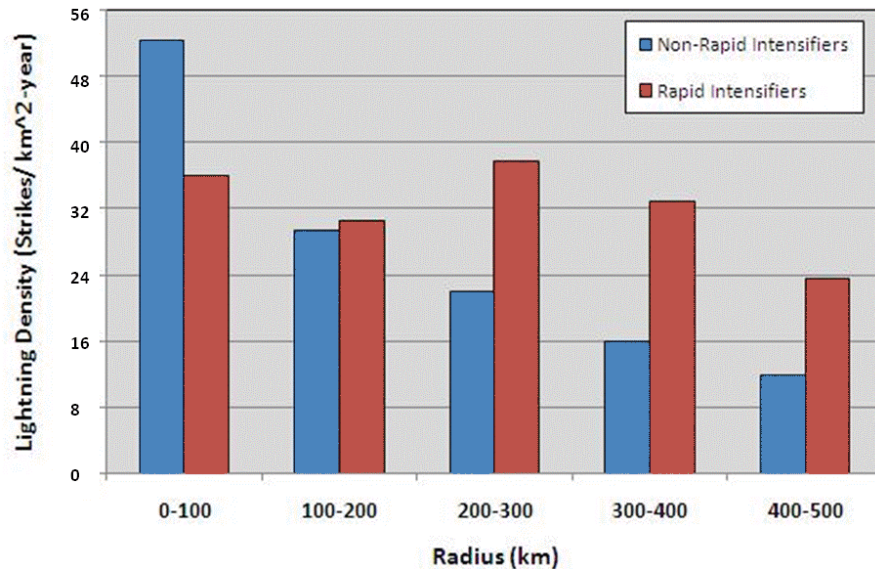
**East Pacific: 1327 cases from 90 tropical cyclones**

**Atlantic: 1154 cases from 86 tropical cyclones**

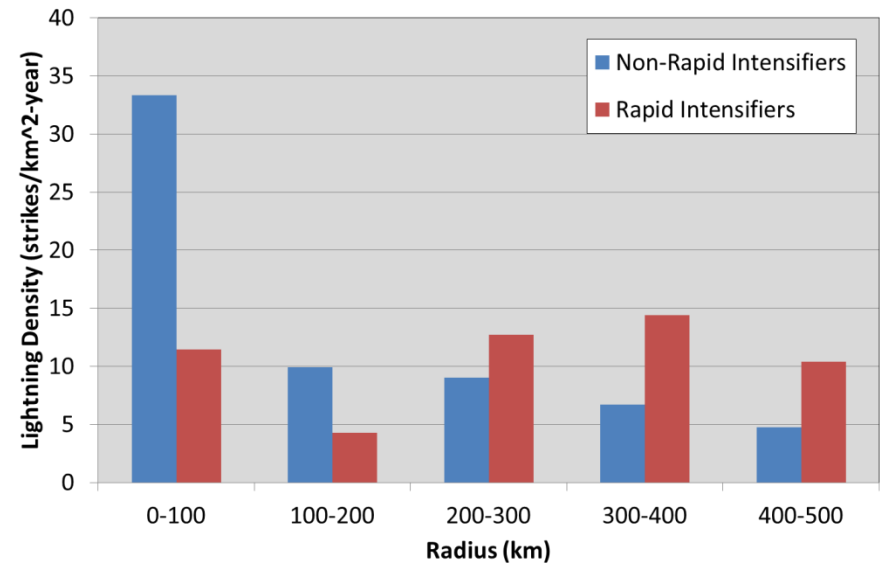
# Rapid Intensification (RI)

- Increase in maximum winds of 30 kt or more in 24 hr
  - Difficult but important forecast problem
- $\sim 10^{\text{th}}$  percentile of long-term climatology
- Environmental factors associated with RI
  - Low shear, large upper-level divergence
  - High oceanic heat content, warm SST, high low-level RH
  - Cold and symmetric cloud tops (from GOES IR)
  - Some intensification in previous 12 hr

# Lightning Density vs. Radius for RI and non-RI Cases



Atlantic



East Pacific

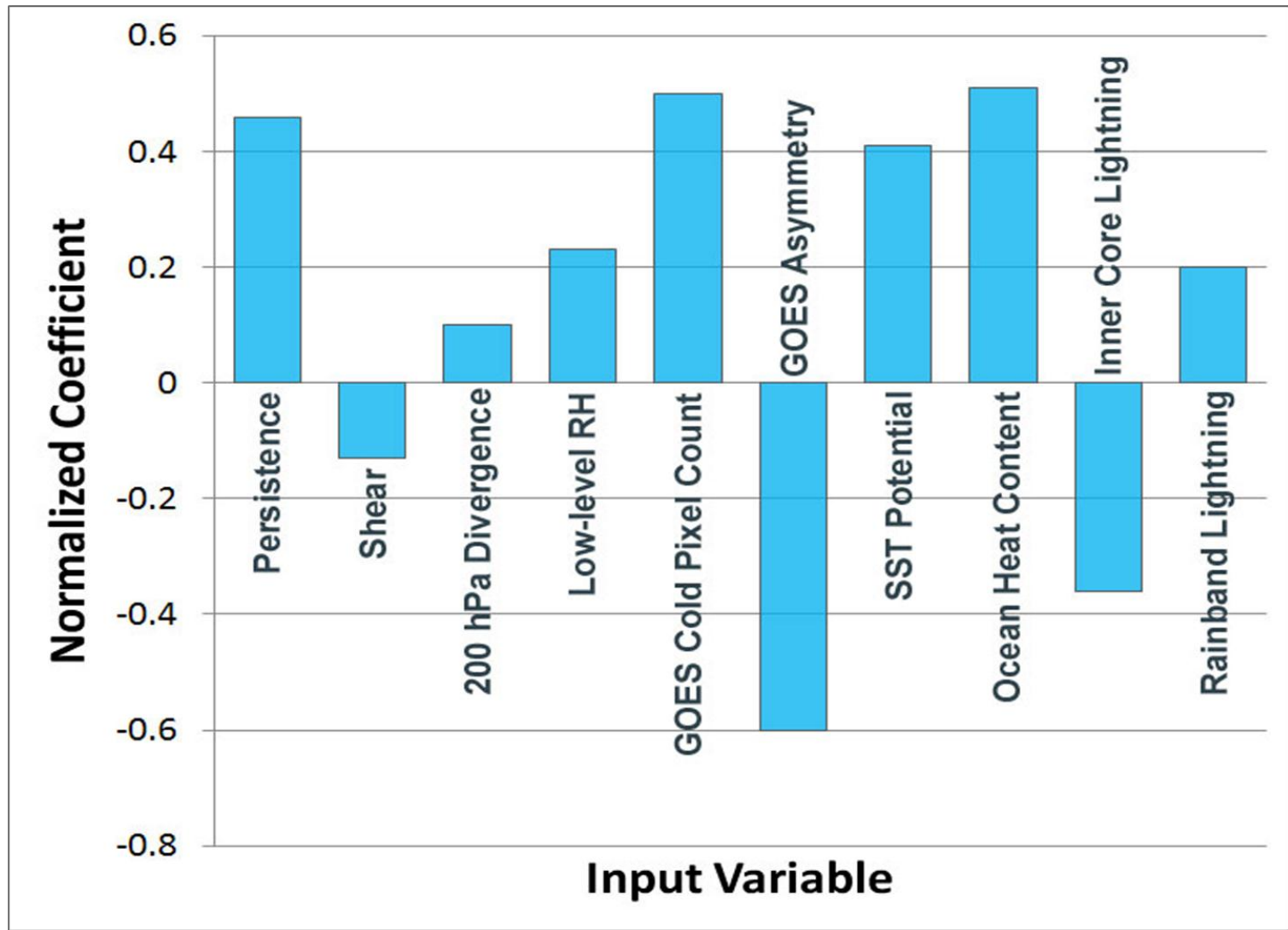
Lightning density also function of vertical shear, SST, initial intensity, etc.

# **Experimental Forecast Algorithm: The Lightning-based Rapid Intensification Index (L-RII)**

- Linear discriminant analysis
  - Optimally weights multiple inputs to separate data sample into 2 classes
  - RI and non-RI cases
- NHC operational RII algorithm includes 8 inputs
- Add 2 lightning parameters for L-RII
  - Inner core density (0-100 km)
  - Rainband density (300-400 km)
- Separate algorithms for Atlantic and East Pacific
- Versions with and without lightning from same developmental sample
- Provides probability of RI in the next 24 hr



# Normalized Discriminant Weights (Atlantic L-RII Algorithm)

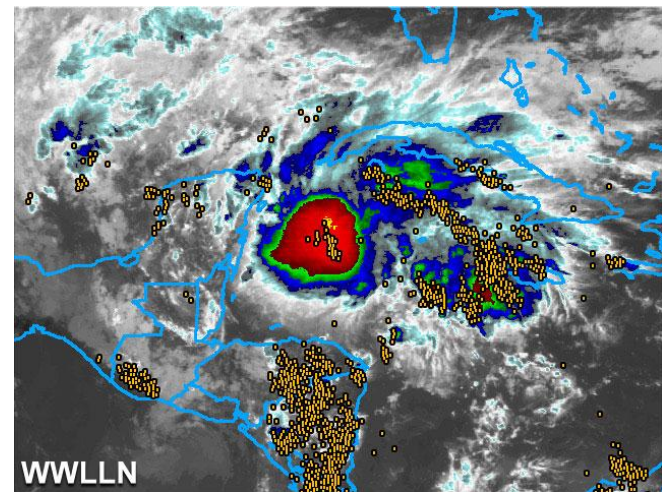
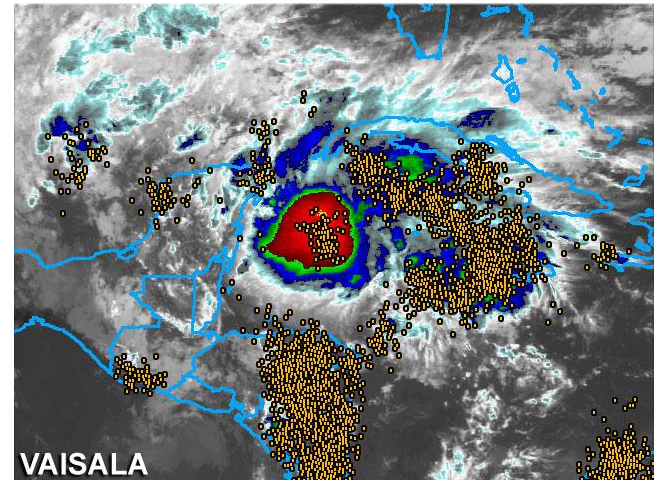


# The GOES-R Proving Ground

- GOES-R will include 16 channel advanced baseline imager and geostationary lightning mapper (GLM)
  - Scheduled for late 2015
- Proving ground provides real-time demonstrations of GOES-R data and products to NWS forecasters
  - Run with proxy data
- 6 products demonstrated at NHC
  - Including experimental rapid intensity algorithm
  - GLM proxy from Vaisala GLD360 lightning locations

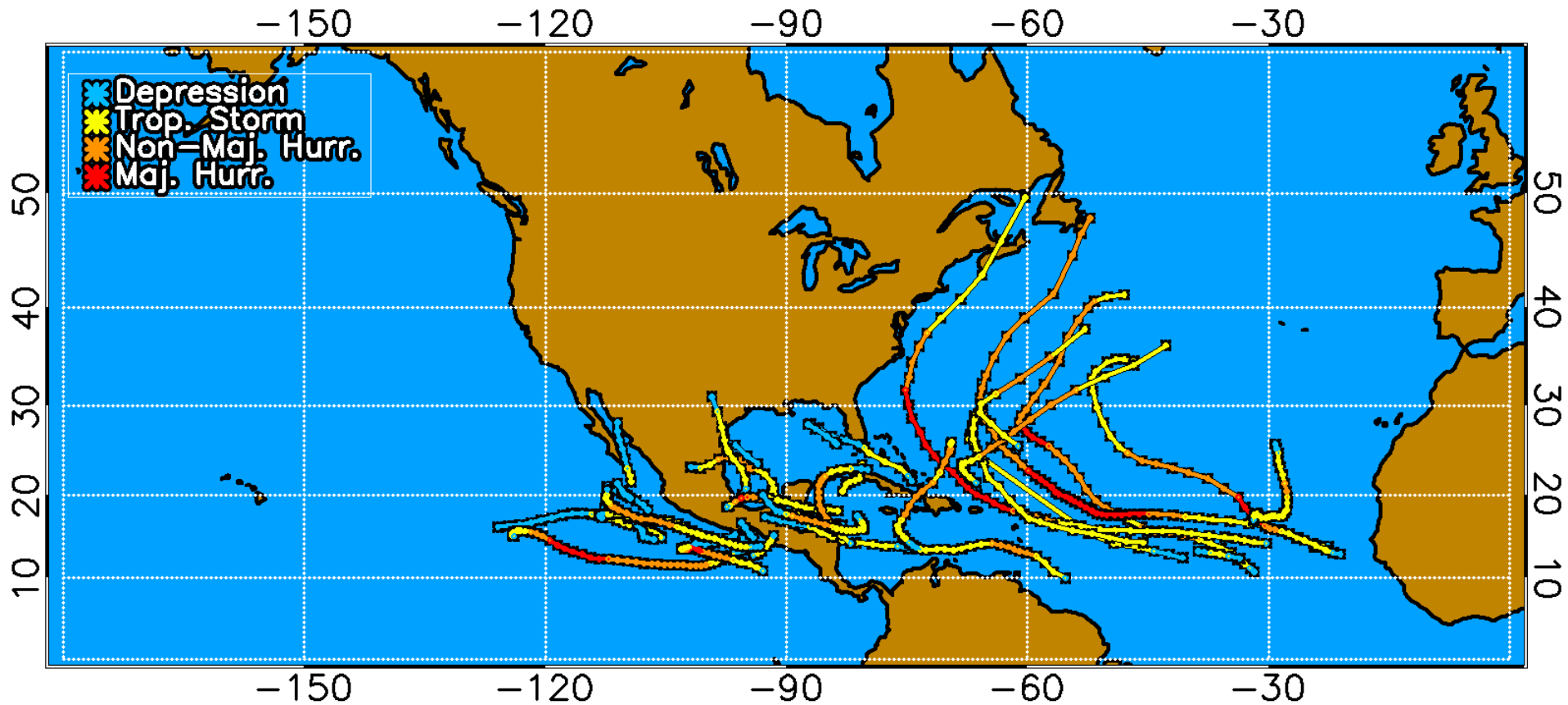
# Normalization of GLD360 data

- Spatially dependent adjustments to GLD360
- Based on 3 month overlap of WWLLN, GLD-360
  - Oct-Dec 2009



Hurricane Ida Nov., 2009

# 2010 Storm Tracks



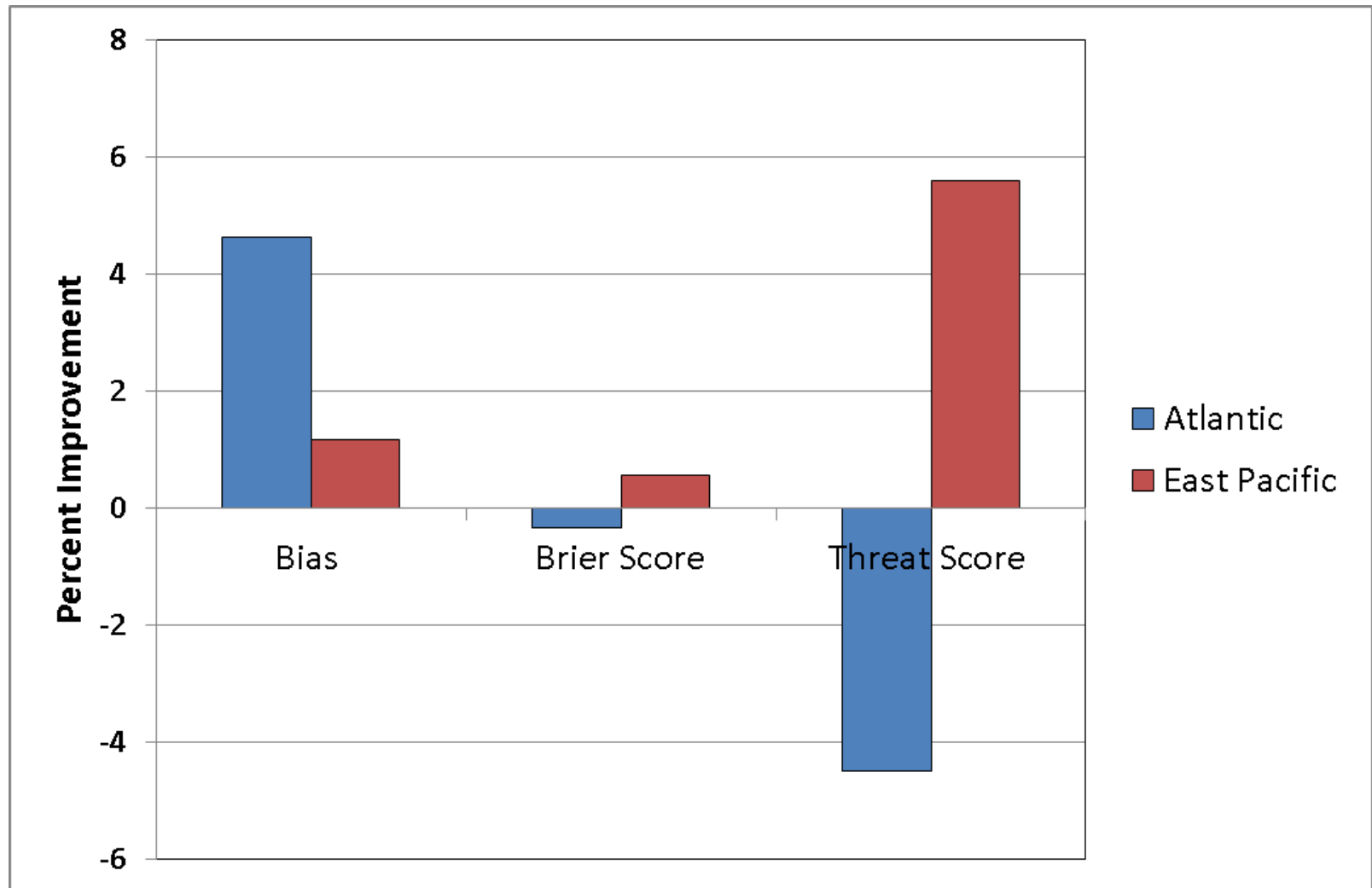
**East Pacific: 121 cases from 12 tropical cyclones**

**Atlantic: 291 cases from 21 tropical cyclones**

# RII Verification Metrics

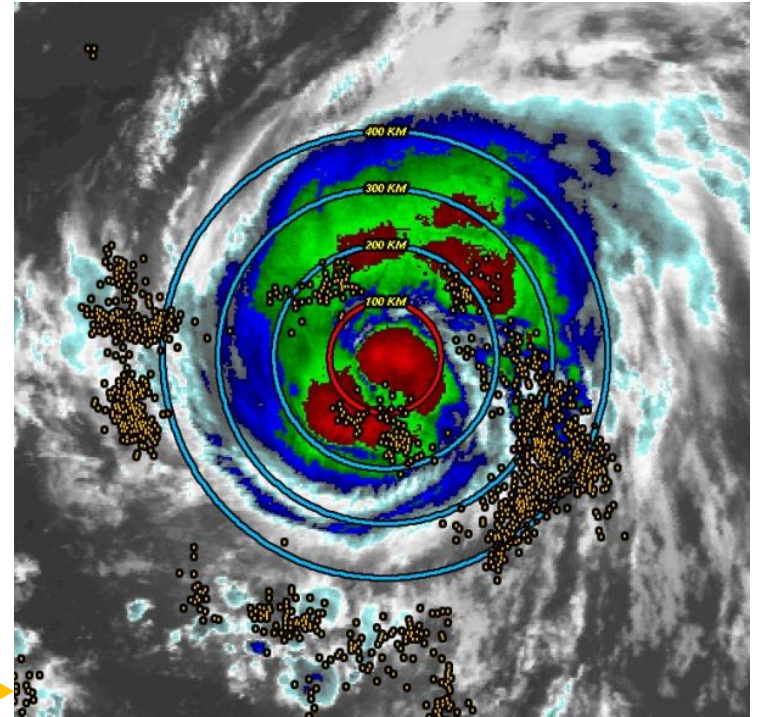
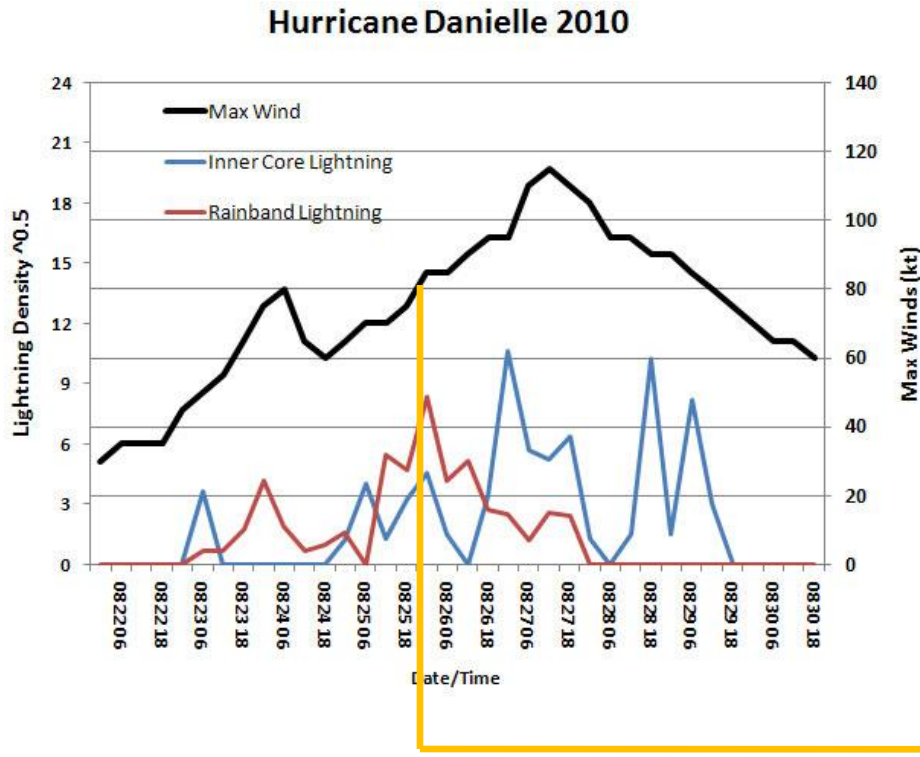
- Bias =  $(\sum P_f / N_{obs}) - 1$
- Brier Score =  $(1/N_f) \sum [P_f - P_{obs}]^2$
- Threat Score =  $a/(a+b+c)$  from 2 by 2 contingency table
  - Area of overlap between forecast and observations
  - Find max TS for range of probability thresholds

# 2010 Preliminary Verification Results: Impact of Lightning Input



# Qualitative Use of Lightning Time Series

## Hurricane Danielle (2010) example

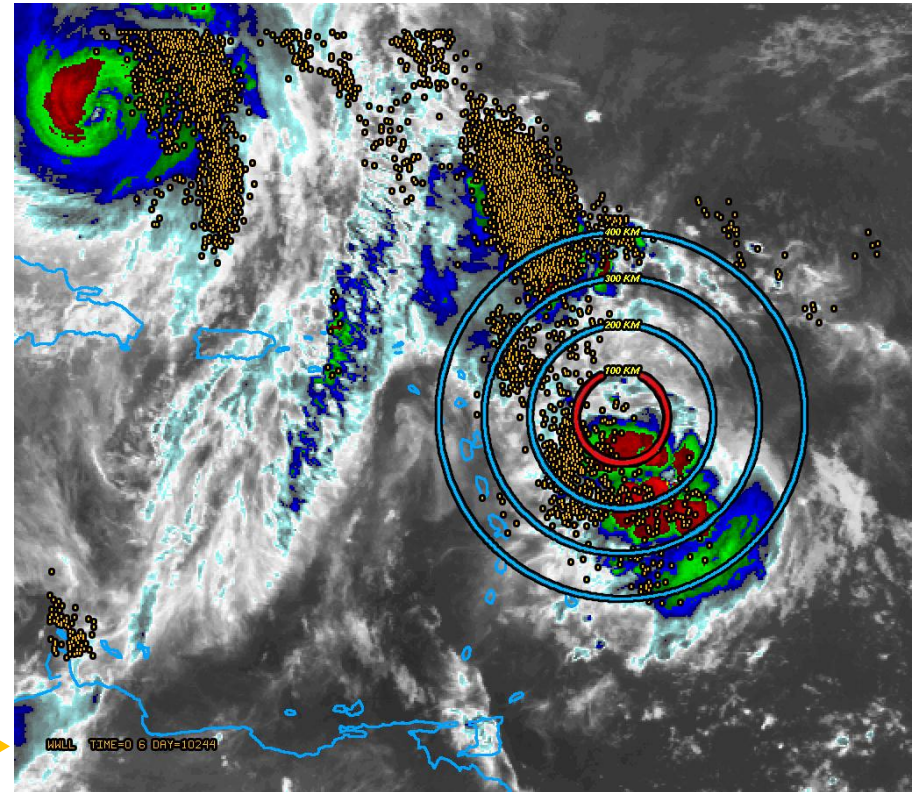
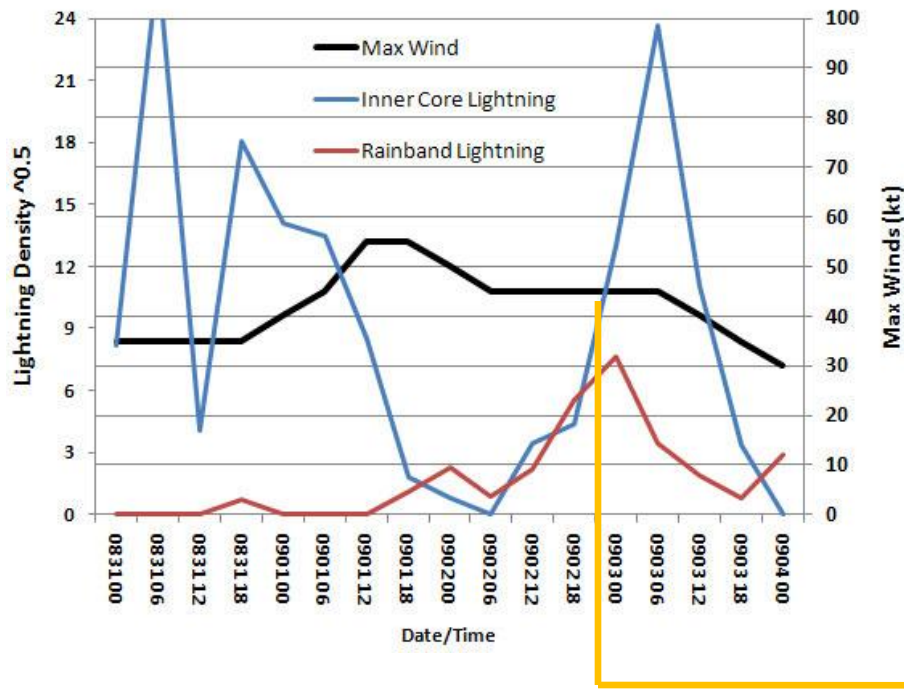




# Qualitative Use of Lightning Time Series

## Tropical Storm Fiona (2010) example

Tropical Storm Fiona 2010





# Conclusions

- Large sample of lightning and large-scale data created for Atlantic and east Pacific tropical cyclones
- Lightning density correlated with intensity changes, initial intensity, shear, SST and other environmental variables
- Experimental rapid intensity forecast algorithm developed
- Inner core and rainband lightning discriminators
- Real time tests in 2010 show promise
  - Reduces bias in Atlantic and east Pacific
  - Mixed results for Brier and Threat Score

# Next Steps

- Repeat 2010 L-RII forecasts with WWLLN input
- Verify using final NHC best tracks
- Test improved RII algorithm
- Additional testing in real time during 2011 hurricane season